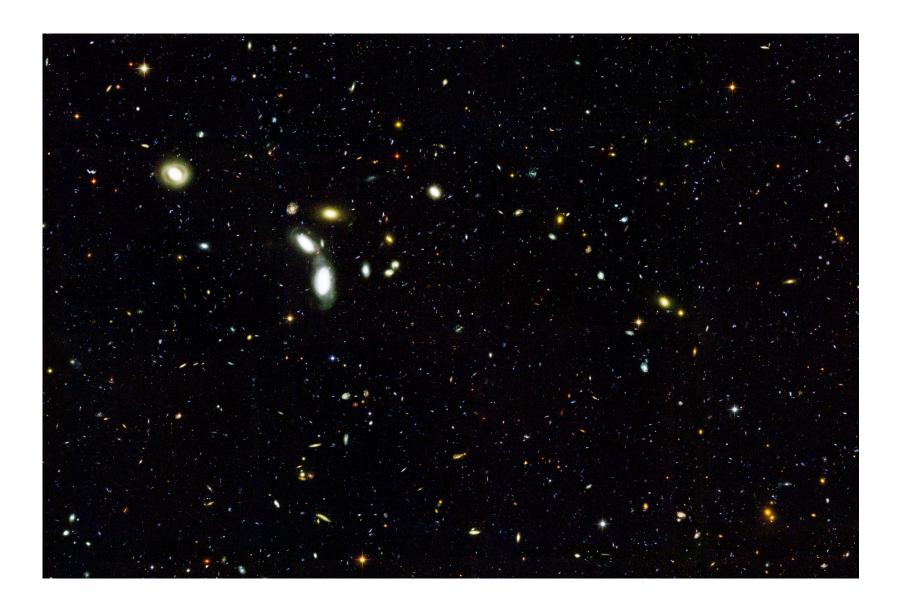
## Galaxy Evolution

Rafal Idzi



# Great Observatories Origins Deep Survey (GOODS)

#### • Basics:

- Two fields: HDFN, CDFS
- 320 sq arcmin (32 x HDFN)
- − Within ~ 0.8 mag of HDFN

#### • Instruments:

- ACS, SIRTF, plus ground based (WFI/ESO, SOFI/ESO, ISAAC, CTIO/NOAO, KPNO, VLT, etc.)
- Chandra
- Bands: X-ray, U, B, V, R, I, J, H, Ks, B, V, i, z, 3.6-8 microns, 24 microns, and Radio

#### Recent Science

- Photometric Redshifts (Mobasher, Idzi, et al.)
- Lyman-break Galaxies z ~ 4 (Idzi, Somerville, Papovich, et al.)
- Comparison of galaxy models (Idzi, Somerville, Ferguson, et al.)
- ApJ Special Issue --- Fall?

## Galaxy Evolution

- How and when galaxies formed stars, assembled their masses, and transformed into the range of morphologies observed locally?
- A complex and subtle problem:
  - many physical parameters depend on time (SFR, Mass assembly,...)
  - SFR regulated by many factors (gas cooling, line transitions, mergers, SNae)

#### Galaxies - Observables

- Information:
  - Spectrophotometric (Luminosity, Redshift)
    - Spectrum (flux vs. wavelength)
    - Photometry (broadband filter throughput)
  - Spatial (Morphology)

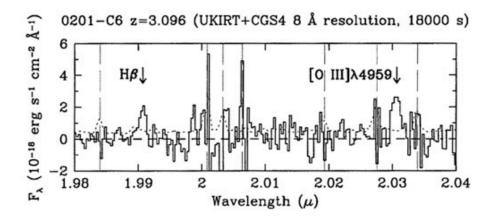
## Galaxies - Physical Parameters

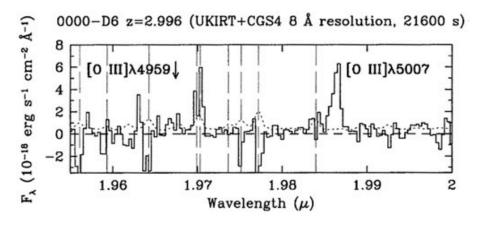
- Mass (Stellar, Dark), Age, Star Formation Rate (SFR), metallicity, dust, ... (Stellar Populations)
- Morphology, size, Kinematics

## Galaxy Evolution

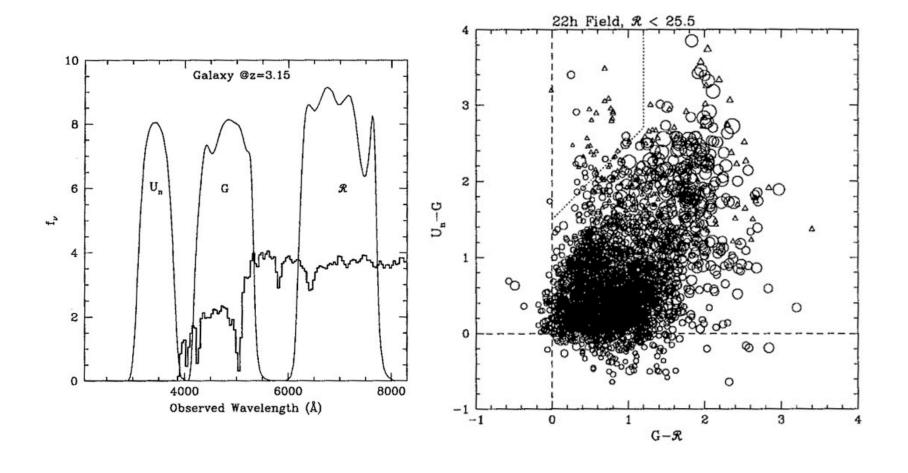
- Observational limits:
  - multiple components (stars, dark matter, gas)
  - spectroscopy expensive and limited
  - integrated light young and old stellar populations
  - degeneracies (age-dust-metallicity)
  - additional selection effects

## Spectroscopy

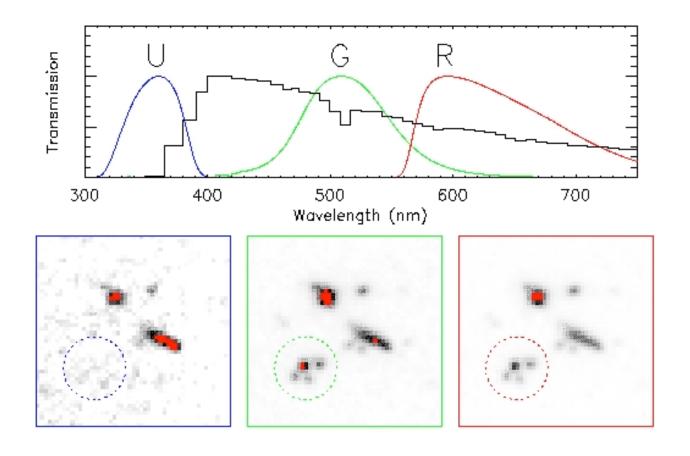




## Lyman-break Technique



## Lyman-break Technique



### Traditional Approach

- Binned distributions of galaxies with their observables (L,z,color,morphology) compared to simplistic models
- Limited parameter space
- No confidence intervals

Qualitative!

### Novel Approach

- Utilize multiple data set
- Test more complex models
- Quantitative constraints on parameters

Aim: given models and data compute the physical parameters (i.e. parameters with the highest likelihood values) -> Bayes' inference

## Bayesian Approach

- CMB, photometric redshifts, CMDs, fundamental plane
- Probability as a measure of plausibility or the degree to which a given hypothesis is true based on the available data

## Bayes' Probability

```
\begin{split} P(\square_i|x) &= P(x|\square_i)P(\square_i)/P(x) \\ P(\square_i|x) &\quad P(x|\square_i)P(\square_i) \; \{P(\square_i) \; \text{all equal} \} \\ \square_i &= \{\text{model: Mass,age,z,SFR,} \square_{\text{metallicity,...}} \\ \square_{\text{Backward (Local) and ab initio (} \square_{\text{CDM})} \\ x &= \{\text{data: photometry} \} \end{split}
```

#### Issues

- Efficient parameterization
- Degeneracies (age-dust-metallicity)
  - Use orthogonal parameters
- Mergers
  - Strong affect on SFR
- Confidence intervals and calibration computationally expensive

# Monte Carlo Markov Chain (MCMC)

- Random walk in parameter space
- Future state depends only on the present state
- Properties: ergodicity, convergence, step size, mixing, ...

#### **MCMC**

- To efficiently explore the likelihood space
  - Random draws from the posterior distribution that are a 'fair' sample of the likelihood space
  - Can estimate relevant quantities (mean, variance, confidence intervals)
  - Scales linearly with the number of parameters

#### **MCMC**

- After a 'burn-in' time samples drawn from a stationary distribution
- Important considerations:
  - Step size
  - Ergodicity
  - Mixing
  - Convergence
  - Reparameterization (degeneracies, poor parameter choices)

#### Model Galaxies

- Use star formation histories from []CDM models and SSP to construct model galaxy SEDs (IMF, dust, [], z, ...)
- Fold spectra through various filters, adjusting for redshift, to get 'observed' fluxes
- Look at number counts, LFs, and color-magnitude diagrams for various models
- Analyze via available statistical means (volume averaged SEDs, Bayes' technique)
- In short: study the self-consistency and parameterization (calibration)

#### Simulation & Models

- SSP single stellar burst with an exponential decay ( $e^{-t/\square}$ )
  - $-\square \sim 10^6$  bursty
  - $\prod \sim 10^{10}$  constant
- Numerical and Semi-Analytic models
  - CDM hierarchical structure formation
  - Gas cooling, star formation, mergers, SNae feedback, chemical enrichment, etc.

### Early GOODS Science Results

- Color-color comparison (i-K<sub>s</sub> vs. i-z)
- Kolmogorov-Smirnov test: 19% vs. 10<sup>-8</sup>
- Incompleteness test:
  - Semi-analytic model: 67%
  - Semi-empirical simulations: 73%
- LBGs at  $z \sim 3$  and  $z \sim 4$  near identical with modest evolution (SFR, Age, Mass, etc.)

#### Main Conclusions

- $\sim 50\%$  mass contained in UV-faint objects with  $z_{850} < 26.5$  missed by optical surveys
- ~ 40% increase in mass of L\* galaxies
   (Papovich et al. volume averaged SEDs)

